

# Urban Landcover Mapping to Aid Regional Assessments of Greenhouse Gases



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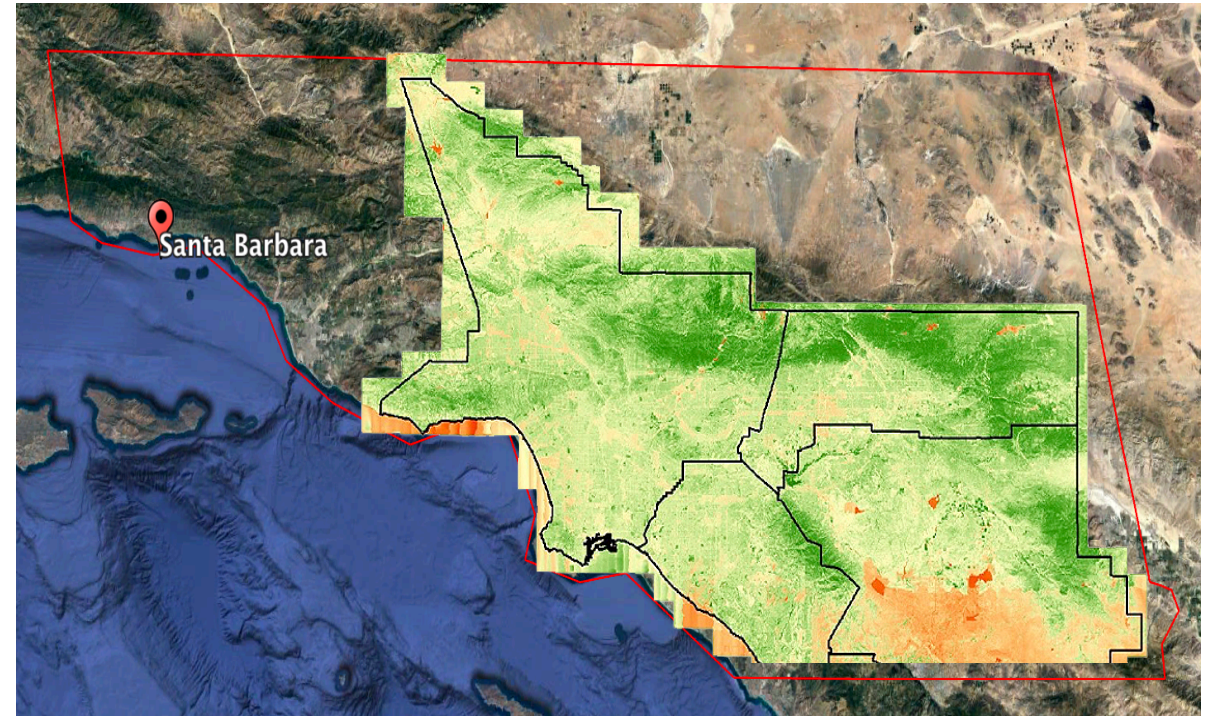
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# Background

- Fossil fuel emissions of greenhouse gases from cities account for 70% of global anthropogenic emissions (Le Quere et al., 2013)
- Unknown influence of urban vegetation on city-scale attribution (Hutyra et al., 2014), but it could be up to 20% of total CO<sub>2</sub> flux (Miller et al., in prep)
- Current landcover maps either:
  - Do not cover the full extent needed to adequately parameterize regional flux inversion models, or
  - Are not at a fine enough spatial resolution





Phase I: Use existing Tree/Grass/Shrub Map over limited domain

Phase II: Derive maps of Tree/Grass/Shrub/Imp. Surface from NAIP

Phase III: Derive maps of Deciduous and Evergreen from Sentinel 2

Phase IV: Derive maps of Irrigated/Non-Irrigated from ECOSTRESS

**Land Surface Change**

- **Vegetation Index (EVI)**
- **Land Surface Water Index (LSWI)**
- Prescribed from Landsat (16 day, 30m) or Sentinel 2b (5 day, 10m)

**Met Forcing**

- **Downward Shortwave (PAR)**
- **Air Temperature (T)**
- WRF-Chem
- 1 hr, 3 km

**Land Cover Specific Parameter Optimization (MCMC or Newton-Raphson)**

Parameter	Observation	
	Urban	Natural
GPP: $PAR_o$ , $\lambda$	SIF Constrained GPP (Merged SIF from OCO-2, OCO-3, TROPOMI, CLARS + FluxCom GPP)	-
TER: $\alpha$ , $\beta$	Chamber TER (Crum, 2016)	-
GPP + TER: $PAR_o$ , $\lambda$ , $\alpha$ , $\beta$	Bernard Field Station NEE (TBD)	Ameriflux NEE (M Goulden)

Urban VPRM

$$NEE_{bio} = R_a + R_h - GPP$$
$$GPP = \lambda \times T_{scale} \times P_{scale} \times W_{scale} \times \left(1 + \frac{PAR}{PAR_0}\right)^{-1} \times EVI \times PAR$$
$$R_h = (1 - ISA) \times \frac{R_{E\_init}}{2}$$
$$R_a = \left(EVI + \min(EVI_{ref}) \times \frac{ISA}{EVI_{ref}}\right) \times \frac{R_{E\_init}}{2}$$
$$R_{E\_init} = \alpha \times T + \beta$$

WRF Stilt Footprints

$NEE_{bio}(x,t)$

Calibration:  $f(x)$

**Merged SIF**  
(Data fusion of LandSat EVI with OCO/TROPOMI SIF)

$NEE_{bio}(x,t)$

**Observed CO<sub>2</sub>**

**Predicted CO<sub>2</sub>**

SIF-GPP  
linear

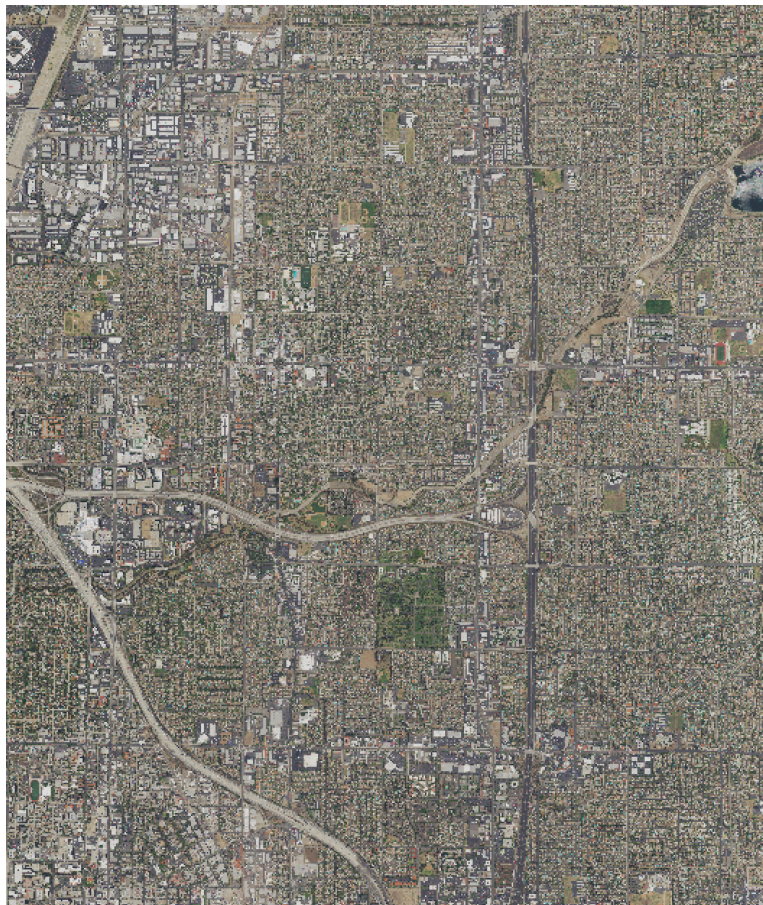
Validation

Attribution:  $f(x,t)$

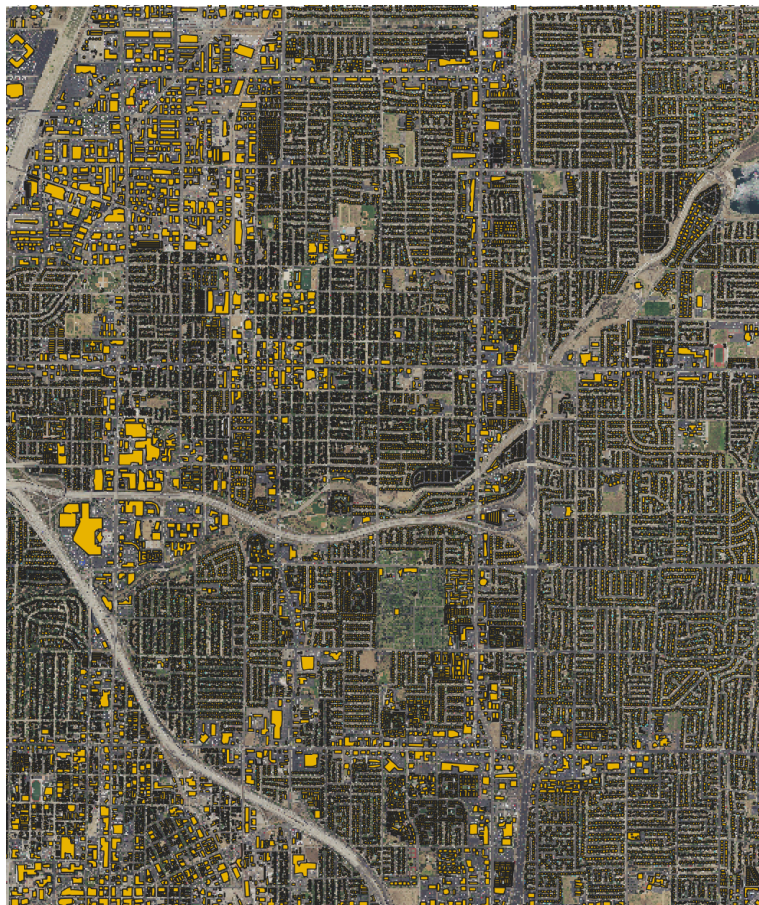
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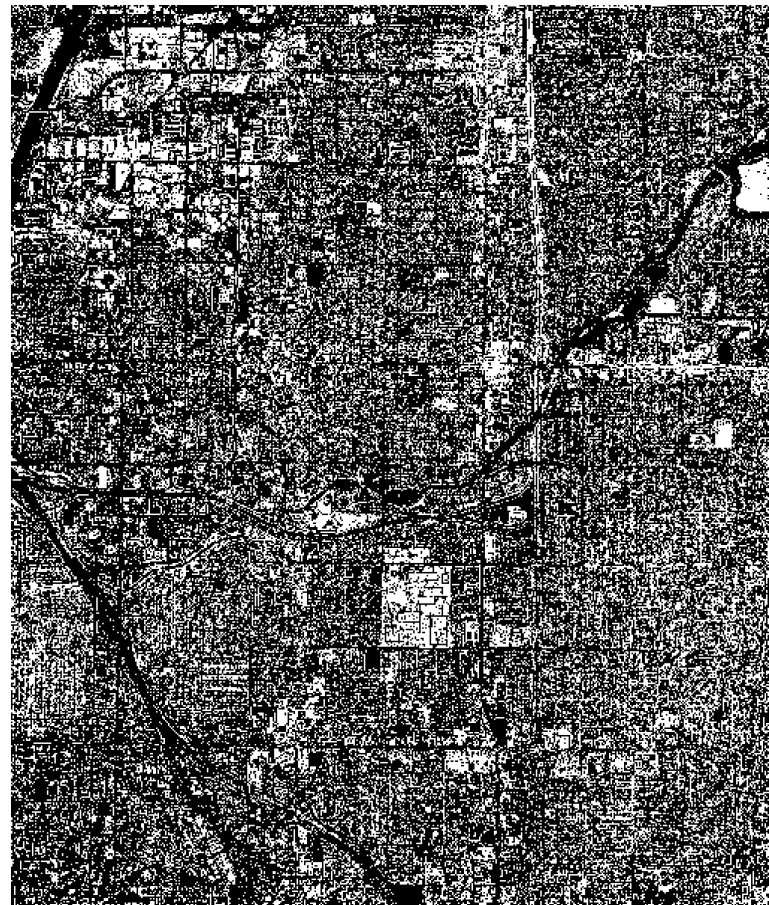
# Example



2016 Leaf-On 1m NAIP Imagery



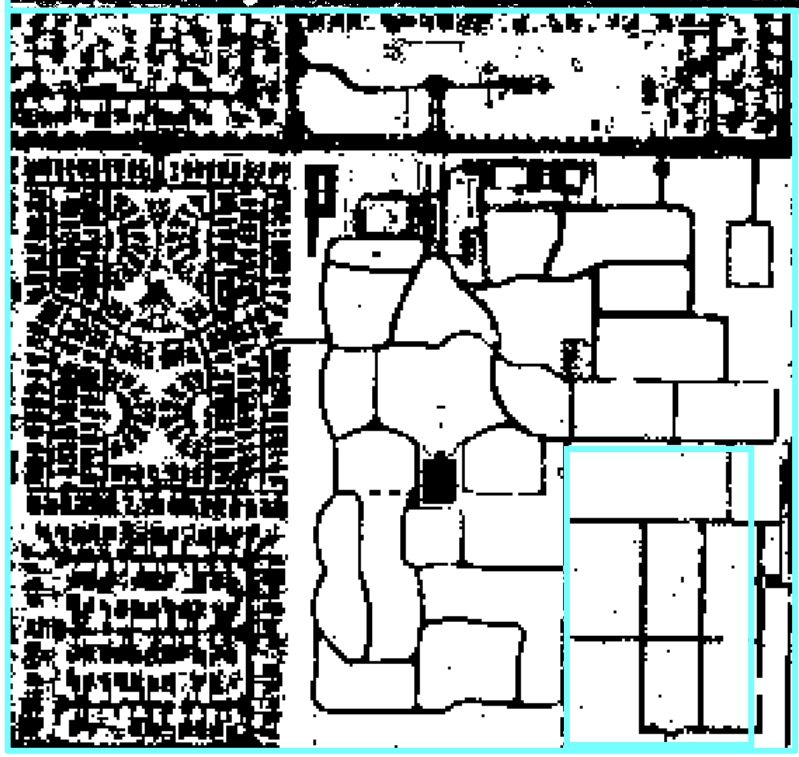
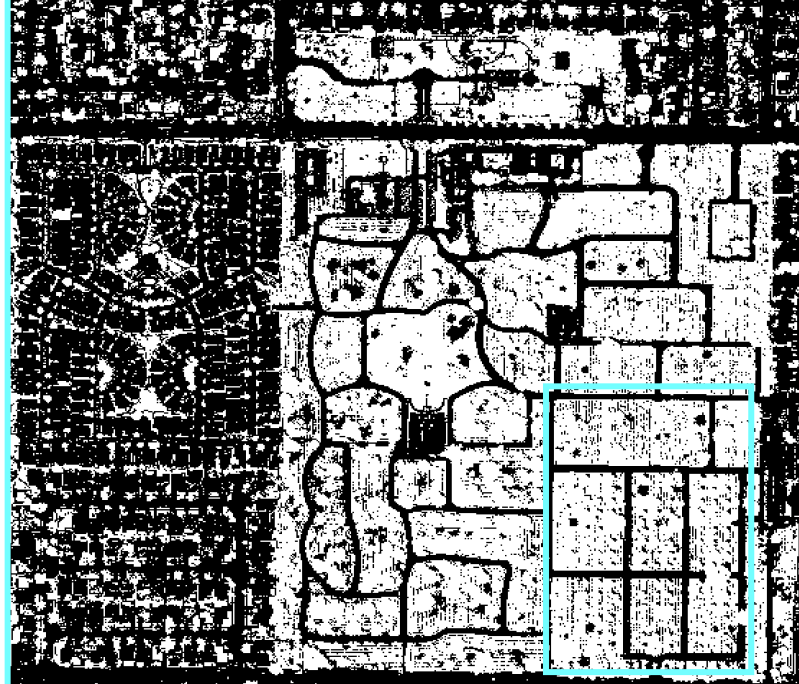
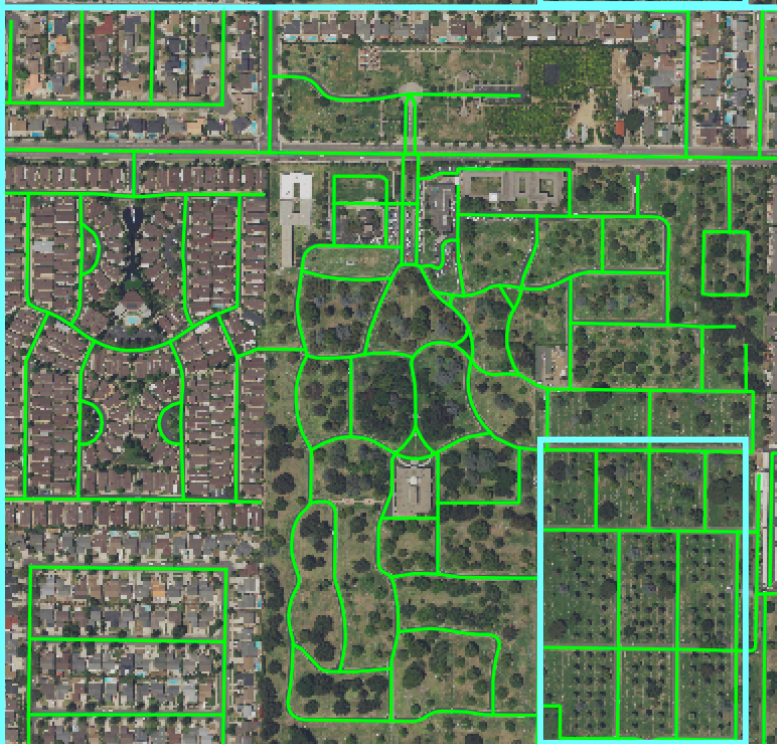
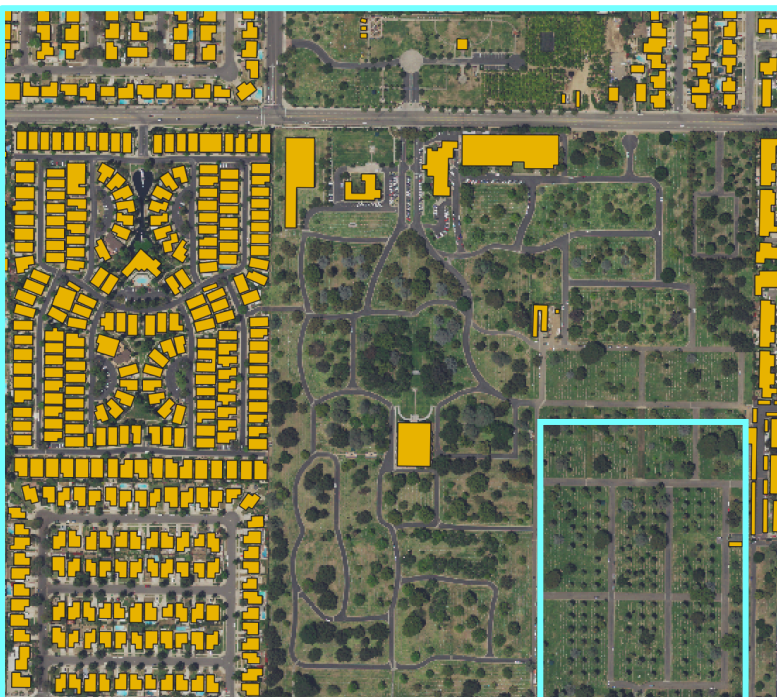
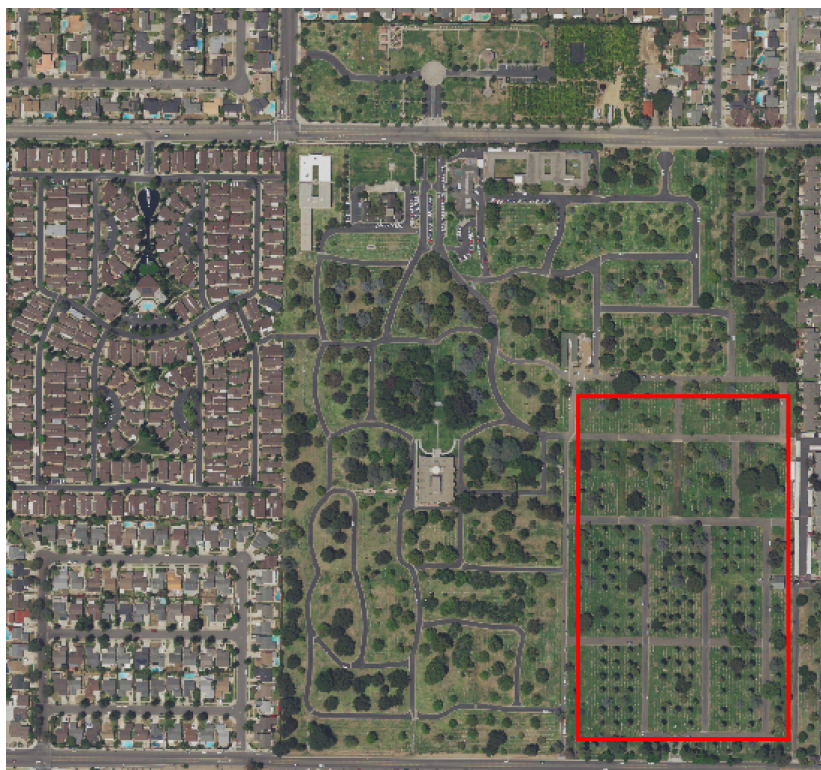
Building Footprints from Microsoft  
and Open Street Maps (Orange)



Initial Impervious Surface Mask  
Black = impervious surface  
White = other (vegetation, NPV,  
water, etc.)

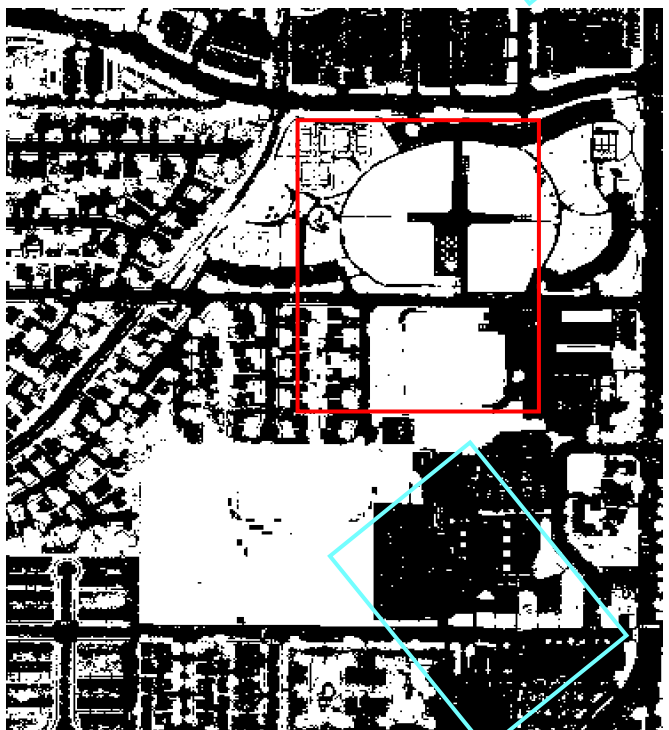
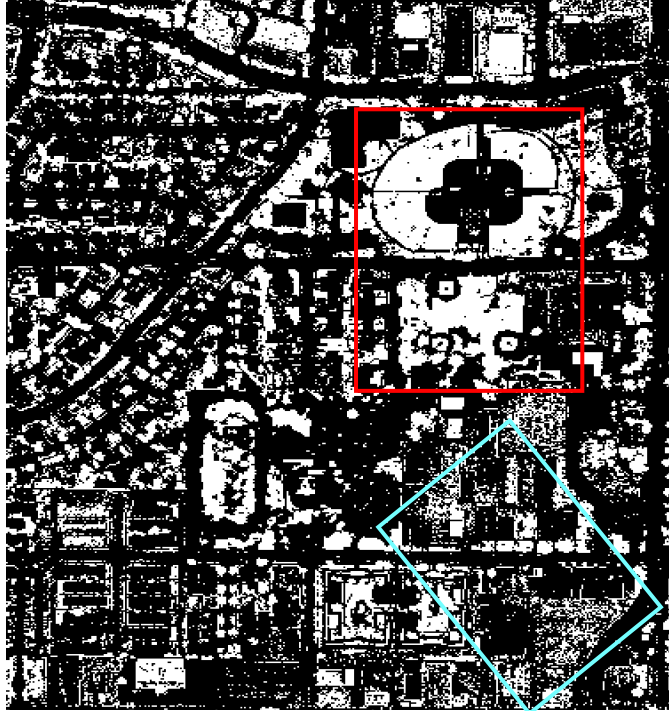
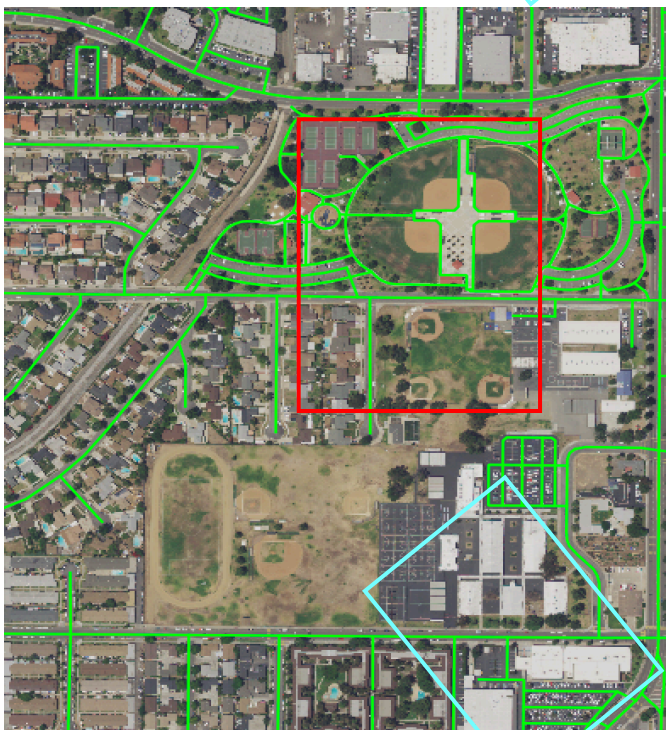
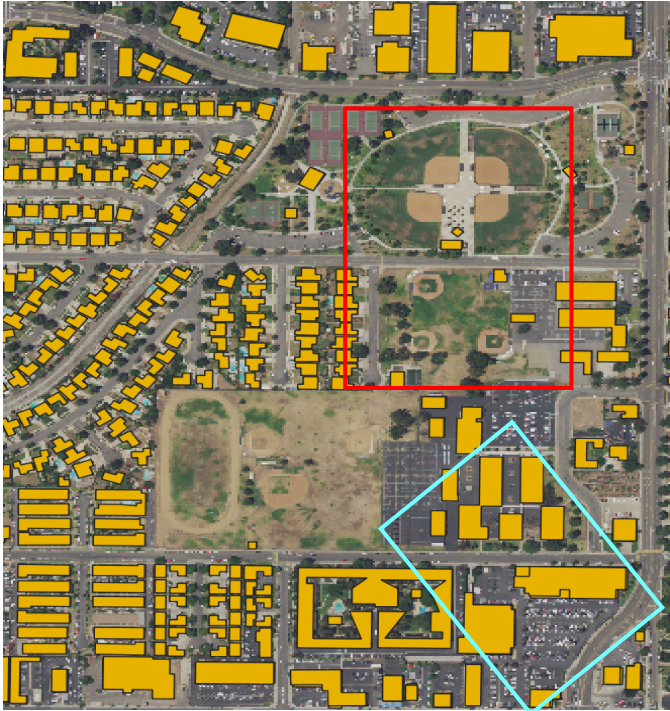


# Example Region of Interest (Santa Ana Cemetery)





# Region of Interest (Mixed Use Development in Orange, CA)





Statistics of Road and Roof: two box plots of NDVI, one for roads and one for roofs from the actual polygon and add text to plot that says the recall above each

- PLACE HOLDER



# Potential Applications

- Energy sector greenhouse gas attribution
- Land Use Programs
  - Tree Planting
  - Grass Conversion